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#### DESCRIPTION

METHOD FOR GENERATING A TEXT SENTENCE IN A TARGET LANGUAGE
AND TEXT SENTENCE GENERATING APPARATUS

Field of the Invention

The present invention relates to a method and apparatus for a natural language processing. Especially, it relates to a method of generating a text sentence in a target language different from a source language by inputting one or more keywords.

# Background Art

There are many known methods of analyzing and generating a text sentence by using a computer. Those methods can be roughly classified into two groups depending on whether analysis and generation of text sentence are performed based on rules established by human beings or established via statistical learning. In the methods of the former group, processing is performed using a sufficiently wide variety of knowledge. In the methods of the latter group, processing is performed using a sufficiently large amount of simple knowledge to improve accuracy of the method.

In order to perform correct analysis and generate a good text sentence, it is desirable to use a wide variety of knowledge such as knowledge obtained from surface

information appearing in or among sentences, knowledge described in a dictionary, linguistic knowledge, etc.

However, in the former method, very complicated rules are required because various kinds of knowledge are treated. The increase in complexity in rules can result in an increase in possibility that conflicts occur among rules. In some cases, arbitration of conflicts among rules is difficult.

If a wide variety of knowledge is used in the latter method, overtraining often occurs. To avoid overtraining, a large amount of learning data is necessary. In the latter method, if a wide variety of knowledge is used and learning is performed properly, the processing accuracy can be improved. However, in the latter method, use of a wide variety of knowledge has not been considered with a few exceptions.

The inventors of the present invention have proposed a new model for text sentence analysis and generation based on the statistical learning. The details of this technique are disclosed in Japanese Unexamined Patent Application No. 2002-334076. This technique is mainly based on the maximum entropy principle, and can efficiently deal with a wide variety of knowledge without falling in overtraining. Experiments have revealed that this technique can provide higher accuracy compared with the conventional statistical

methods. In this method, a technique has been established as to how efficiently to use knowledge obtained by learning data, dictionary knowledge, linguistic knowledge, etc., and as to what kind of knowledge should be used in text sentence analysis and generation.

A specific example of a text generation system is disclosed, for example, in Japanese Unexamined Patent Application No. 2003-196280 filed by the present applicant. In this system, when one or more keywords are input, text sentences including the input keywords are extracted from a database, and morphological and syntax structure analysis is performed on the extracted text sentences. Based on the result of the analysis, a text sentence including the keywords is generated.

In a system disclosed in Japanese Unexamined Patent Application No. 2003-271592, word-unit candidates are generated from input keywords, and dependency relationships among the word-unit candidates are assumed. A text sentence candidate is generated according to the assumed dependency relationships. This method allows a natural text sentence to be produced from a small number of keywords.

The techniques described above generates a text sentence in a certain language, for example, Japanese, from keywords in the same language and do not generate a text sentence in a language different from the language of

keywords. That is, in the known techniques, a text sentence in the same language as the language of input keywords is generated based on a monolingual corpus, and application of the method disclosed in Japanese Unexamined Patent

Application No. 2003-271592 above mentioned to generation of a text sentence in a language different from the language of input keywords has not been achieved.

Machine translation is known as a technique to output a text sentence in a language different from a language of an input text sentence. In machine translation, in general, an input text sentence in a source language is analyzed, and a translation thereof in a target language is generated from the analysis result.

If a natural text sentence can be output from keywords without needing a full text sentence, it becomes very convenient for a user to communicate with another user.

In recent years, it has become easy for a large number of people over the world to communicate with one another via a network. However, there is still a language barrier, which makes it difficult to communicate with one another speaking different languages. Although great advances in machine translation have been made, commercially available machine translation systems are not sufficiently high in performance to allow users speaking different languages to communicate easily with one another.

Thus, there is a need for a target-language text sentence generation method that eliminates the language barrier and that allows users to easily communication with one another in various nations.

In view of the above, an object of the present invention is to provide a method for generating a natural text sentence in a target language different from a source language, based on one or more keywords of the source language given by a user and target language text sentence generating apparatus.

## Disclosure of Invention

To achieve the above object, the present invention provides a method of generating a text sentence in a target language different in a source language, based on one or more words in the source language input as keywords. In an input step of the method, one or more keywords in the source language are input via an input means. The method comprises further a sentence pair extraction step in which a sentence pair extraction means extracts one or more sentence pairs each including at least one of the keywords from a parallel corpus database including partial correspondence information indicating correspondence between a word/phrase in the source language and a word/phrase in the target language in each sentence pair, a keyword-related phrase storage step in

which a target-language keyword-related phrase corresponding to each source-language keyword-related phrase is detected from the partial correspondence information of each sentence pair and stored in the form of a keyword-related phrase table in a storage means, a text sentence candidate generation step in which a text candidate generation means assumes dependency relationships among keyword-related phrases in the target language described in the keyword-related phrase table and generates one or more target-language text sentence candidates. In an output step of the method, at least one text sentence candidate is output from an output means.

The method may further comprise a keyword-related phrase presentation step in which if, in the sentence pair extraction step, two or more sentence pairs are extracted for a keyword input in the input step and if two or more different keyword-related phrases in the source language are detected from the partial correspondence information, then the detected two or more keyword-related phrases in the source language are presented to a user such that the user is allowed to select a keyword-related phrase from the presented two or more keyword-related phrases, wherein in the keyword-related phrase storage step, if the user selects a keyword-related phrase from the presented two or more keyword-related phrase in the

target language corresponding to the selected keywordrelated phrase in the source language is described in the keyword-related phrase table.

In the method of generating a text sentence in the target language, each time one keyword is input in the input step, the sentence pair extraction step and the keywordrelated phrase storage step may be performed, and the method may further comprise a co-occurrence word extraction step in which one or more co-occurrence words which co-occur with the keyword in the sentence pair are extracted and the extracted one or more co-occurrence words are described in a co-occurrence word table, and a co-occurrence word presentation step in which the one or more co-occurrence words are presented to a user such that the user can select one or more co-occurrence word from the co-occurrence words described in the co-occurrence word table, wherein if one or more co-occurrence words are selected by the user in the input step, the selected one or more co-occurrence words are input as new keywords, and the text sentence candidate generation step is performed after completion of inputting all keywords.

Furthermore, in the sentence pair extraction step in the method of generating a text sentence in a target language, at the beginning of the step, one or more morphemes may be added to or subtracted from a keyword input

in the input step or a keyword input in the input step may be replaced with a similar word.

It is the method of generating a text sentence of a plurality of target languages, wherein a text sentence may be generated for each of two or more target languages by performing the sentence pair extraction step, the keyword-related phrase storage step, and the text sentence candidate generation step for each combination of source and target languages. For example, to generate a text sentence in each of first, second and third target languages, the steps described above are performed for each of a combination of the source language and the first target language, a combination of the source language and the second language, and a combination of the source language and the third target language. Then, in the output step, text sentence candidates of all target languages may be output.

Furthermore, in the text sentence candidate generation step of the method, preferably, the text candidate generation means assumes dependency relationships among keyword-related phrases in the target language described in the keyword-related phrase table and generates one or more target-language text sentence candidates, and a source-language text candidate generation means assumes dependency relationships among keyword-related phrases in the source language described in the keyword-related phrase table and

generates one or more source-language text sentence candidate. Then, in the output step, at least one set of text sentences in the source and target languages is output from the output means.

In the method may further comprise, after the text sentence candidate generation step, an evaluation step in which an evaluation means evaluates each text sentence candidate, wherein in the output step, at least one text sentence candidate is selected based on the evaluation and the selected text sentence candidate is output.

In the present invention also provides an apparatus for generating a text sentence in a target language as mentioned below.

That is, it is an apparatus for generating a text sentence in a target language different in a source language, based on one or more words in the source language input as keywords, the apparatus comprising an input means for inputting one or more keywords in the source language, a parallel corpus database including partial correspondence information indicating correspondence between a word/phrase in the source language and a word/phrase in the target language in each sentence pair, a sentence pair extraction means for extracting one or more sentence pairs each including at least one of the keywords from the parallel corpus database, a keyword-related phrase storage means for

detecting a target-language keyword-related phrase corresponding to each source-language keyword-related phrase from the partial correspondence information of each sentence pair and storing the detected target-language keyword-related phrase in the form of a keyword-related phrase table, a text candidate generation means that assumes dependency relationships among keyword-related phrases in the target language described in the keyword-related phrase table and generates one or more target-language text sentence candidates; and an output means for outputting at least one text sentence candidate.

In the apparatus may further comprise a source-language keyword-related phrase candidate presentation means that determines, in a case in which two or more sentence pairs corresponding to an input keyword have been extracted by the sentence pair extraction means, whether two or more different keyword-related phrases in the source language are detected from the partial correspondence information associated with the two or more sentence pairs and that, if so, presents to a user the detected two or more keyword-related phrases such that the user is allowed to select a keyword-related phrases in the source language via the input means, wherein if the user selects a keyword-related phrases from the presented two or more keyword-related phrases, the

keyword-related phrase storage means stores a keyword-related phrase in the target language corresponding to the selected keyword-related phrase in the source language in the keyword-related phrase table.

In the apparatus for generating a text sentence in the target language, each time one keyword is input via the input means, the sentence pair extraction means and the keyword-related phrase storage means may operate, and the apparatus may further comprise a co-occurrence word extraction means for extracting one or more co-occurrence words which co-occur with the keyword in the sentence pair and describing the extracted one or more co-occurrence words in a co-occurrence word table, and a co-occurrence word presentation means for presenting the one or more cooccurrence words to a user such that the user can select one or more co-occurrence word from the co-occurrence words described in the co-occurrence word table, wherein if one or more co-occurrence words are selected by the user via the input means, the selected one or more co-occurrence words are input as new keywords, and the text candidate generation means operates after completion of inputting all keywords.

Further, the apparatus for generating a text sentence in the target language may comprise a keyword modification means for modifying a keyword input via the input means by adding or subtracting one or more morphemes to or from the

keyword or replacing the keyword with a similar word, wherein the sentence pair extraction means performs keyword modification using the keyword modification means.

In the apparatus for generating a text sentence in the target language, preferably, the parallel corpus database includes partial correspondence information indicating correspondence between a word/phrase in the source language and a word/phrase in the target language in each sentence pair, the sentence pair extraction means, the keyword-related phrase storage means, and the text candidate generation means may perform processing for each combination of source and target languages, and text sentence candidates of respective two or more languages may be output from the output means.

In the apparatus for generating a text sentence in the target language, preferably, the text candidate generation means assumes dependency relationships among keyword-related phrases in the target language described in the keyword-related phrase table and generates one or more target-language text sentence candidates, and the apparatus further comprises a source-language text candidate generation means that assumes dependency relationships among keyword-related phrases in the source language described in the keyword-related phrase table and generates one or more source-language text sentence candidate, wherein at least one set

of text sentences in the source language and target languages may be output from the output means.

In the apparatus for generating a text sentence in the target language, the evaluation means for evaluating the one or more text sentence candidates.

#### BRIEF DESCRIPTION OF THE DRAWINGS

- Fig. 1 is a diagram showing a dependency structure tree of a corpus used in the present invention.
- Fig. 2 is a flow chart associated with a text sentence generation method according to example 1 of the present invention.
- Fig. 3 is a flow chart associated with a text sentence generation method according to example 2 of the present invention.
- Fig. 4 is a flow chart associated with a text sentence generation method according to example 3 of the present invention.
- Fig. 5 is a flow chart associated with a text sentence generation method according to example 4 of the present invention.
- Fig. 6 is a flow chart associated with a text sentence generation method according to example 5 of the present invention.
  - Fig. 7 is a block diagram of a text generation

apparatus according to the present invention.

Fig. 8 is a block diagram of an input unit according to the present invention.

Fig. 9 is a block diagram of a translation pair extractor and a keyword-related phrase storage unit according to the present invention.

Fig. 10 is a block diagram of a text generator according to the present invention.

Fig. 11 is a diagram showing an example of a manner in which a text sentence is generated from English keyword-related phrases.

Fig. 12 is a diagram showing the relationships between English keyword-related phrases and word sequences.

Fig. 13 is a block diagram of a text generator according to an example of the present invention.

Fig. 14 is a flow chart associated with a text sentence generation method according to example 6 of the present invention.

Fig. 15 is a block diagram of a text generator (example 6) of the present invention.

## DESCRIPTION OF THE PREFERRED EMBODIMENTS

The present invention is described in further detail below with reference to, by way of example but not limitation, preferred examples in conjunction with the

accompanying drawings.

First, the present invention is outlined. In conventional machine translation, when a text sentence in a source language is given, a translated text (sentence or assembly thereof) in a target language is output. Although an improvement in translation accuracy has been achieved in recent years, a translation is often unnatural because of difficulty in analysis of the text sentence in the source language and difficulty in generation of the text sentence in the target language. Such an unnatural text sentence, which is grammatically correct in many cases, can cause difficulty in communication.

Depending on the performance of the machine translation system, it is needed to modify an input text sentence in the source language into a form that can be better handled by the system. Besides, it is required that the input text sentence should include a necessary and sufficient words. Thus, a special skill is needed to use the machine translation system. On the other hand, the Internet has become very popular. The internet provides an environment in which a user can communicate with a very large number of other users over the world. To freely communicate with many people over the world, there is an urgent need for a technique that generates a correct text sentence in a target language.

In view of the above, the present invention provides a technique of, when one or more keywords in a source language are input, generating a text sentence in a target language from the input keywords. That is, when a user inputs one or more source-language words that are important in what is to be told to another user, one or more pairs of a source-language sentence including at least one of the input keywords and a translation thereof in a target language (hereinafter, such a pair will be referred to simply as a sentence pair) are extracted from a database. A text sentence in the source language corresponding to the generated text sentence in the target language is presented to the user, and thus the user can confirm whether the generated text sentence in the target language correctly represents what the user wants to tell.

In the present invention, a collection of a large number of pairs of a sentence in the source language and a translation thereof in the target language is stored in the form of a database called a parallel corpus database. Preferably, translations in the parallel corpus database are prepared by human translators. The parallel corpus database includes syntactic information of each sentence and also includes information indicating correspondence of phrase or clause between two languages.

The inventors of the present invention have developed a

Japanese-English corpus including about 40,000 sentence pairs associated with newspaper articles. Translations of this corpus were prepared by professional human translators.

In this corpus, one Japanese sentence is translated into an English sentence (one sentence) and natural one. When an original Japanese sentence has no explicit subject, a subject is determined based on context and the determined subject is added to the original sentence. The subject may be of a noun, pronoun, or a proper noun depending on the context. Thus, Japanese sentences and corresponding English sentences included in this corpus are very natural in expression.

Data form of the corpus is described below briefly. For example, when a Japanese sentence "また、一九九五年中の衆院解散・総選挙の可能性に否定的な見解を表明、二十日召集予定の通常国会前の内閣改造を明確に否定した。(hereinafter, pronunciation of words were expressed in alphabet with parenthesis) (mata, 1995-nen chu no shu-in kaisan/sousenkyo no kanousei ni hiteiteki na kenkai wo hyoumei, hatsuka shoushu yotei no tsujou kokkai mae no naikaku kaizou wo meikakuni hitei shita.) " is given, a dependency structure tree is defined as shown in Fig. 1, in which an ID number is assigned to each phrase and described on a side left to each phrase. Furthermore, phrase numbers, dependency relationships, morphemes, pronunciation, and word class are represented as follows.

\* 0 12D また また(mata) \* conjunction \* \* \* 、 、 \* special comma \* \* \* 1 2D 一九九五 いちきゅうきゅうご(itikyukyugo) \* noun numeral \* \*

年 ねん(nen) \* suffix nominal-noun-countersuffix \* \*

中 ちゅう(chu) \* suffix nominal-nounsuffix \* \*

 $\mathcal{O}$   $\mathcal{O}$  (no) \* particle conjunctive-particle \* \*

Below is an example of an English translation of the above Japanese sentence. "He also responded negatively to the possibility of dissolution of the House of Representatives and general elections before the end of 1995 and clearly denied a cabinet reshuffle would take place prior to the ordinary Diet session scheduled to be convened on the 20th." The correspondence between each phrase in the Japanese sentence and a counterpart in English is represented as follows:

# (Example 1)

Fig. 2 is a flow chart associated with a target language text sentence generation method according to Example 1 of the present invention. As shown in Fig. 2, when one or more words/phrases 1 in a source language (Japanese) are input as keywords, one or more pairs of a source language sentence including at least one of the input keywords (1) and a translation thereof in a target language (such a pair is referred to simply as a sentence pair) are extracted (2) from the parallel corpus database (10).

Thereafter, one or more keyword-related words/phrases in the target language corresponding to each keyword included in the extracted sentence pairs are extracted from partial correspondence information (11), and described in a keyword-related phrase table (12). Note that the partial correspondence information (11) is information included in the parallel corpus database (10), the partial correspondence information (11) and the keyword-related phrase table (12) are the same.

Thus, words/phrases in the target language corresponding to the input keywords are obtained. Dependency relationships among these words/phrases are properly assumed, and one or more target-language text sentence candidates to be output are generated (4).

Text sentence candidates obtained may be directly output without being evaluated, but these text sentence candidates in the example are evaluated and a most suitable sentence is selected from the candidates (5). The selected sentence (in English) is output (6).

Fig. 7 shows a text generation apparatus in which the text sentence generation method according to the present invention is implemented. If Japanese keywords, for example, "彼女(kanojo)", "公園(kouen)", and "行く(iku)" are input to an text generation apparatus (30) via an input unit (40), a translation pair extractor (50) extracts one or more sentence pairs including at least one of the input keywords from the database. In this specific example, "公園へ行った (Kouen he itta)/I went to the park", "彼女と百貨店へ行った (kanojo to hyakkatten he itta)/I went to the department store with her" are extracted as sentence pairs.

A keyword-related phrase storage unit (60) extracts word/phrase pairs associated with any keyword from the sentence pairs, based on partial correspondence information and stores the extracted word/phrase pairs. In this specific example, "公園へ(kouen e)/to the park", "行った (itta)/I went", and "彼女と(kanojo to)/with her" are extracted and stored.

A text generator (70) generates an English text sentence "I went to the park with her" based on the

extracted word/phrase pairs. The resultant English text sentence (32) is output from output unit (80).

The parts (40) to (80) are described in further detail below.

As shown in Fig. 8, the input unit (40) includes a CPU (41) and other parts connected to the CPU (41), such as a mouse (42), a keyboard (43) and a storage unit (44) such as a CD drive, a hard disk drive, a MO drive, or a floppy (registered trademark) disk drive. The input unit (40) may further include a memory used by the CPU (41).

A user can directly input keywords using the mouse (42) or the keyboard (43).

In the present invention, it is also possible to receive keywords from another computer server or the like via a network (45) such as the Internet or an intranet.

A touch panel monitor (46) known in the art may be used to provide a simpler input method.

The input Japanese keywords (31) are transferred from the input unit (40) to the translation sentence pair extractor (50) and the keyword-related phrase storage unit (60) shown in Fig. 9.

In the present example, the translation pair extractor (50) and the keyword-related phrase storage unit (60) are included in the same processing unit (51). Note that processing is performed by the CPU in cooperation with a

memory.

First, the translation pair extractor (50) extracts one or more sentence pairs including at least one of the Japanese keywords (31) from the parallel corpus database (52) stored in an external storage.

In a case in which a Japanese keyword (31) input by a user includes an adjective or a particle in addition to a main word or in a case in which two or more words(phrase) are input as a Japanese keyword (31), the keyword may be converted into a basic form or the two or more words may be divided into two or more keywords, by using a known language processing method such as a method based on morphological analysis.

In many cases, particles or adjectives play important roles when the keyword-related phrase storage unit (60) correctly extracts keyword-related words/phrases. Therefore, it is desirable to extract keyword-related words/phrases from the parallel corpus database (52), based on keywords including adjectives and/or particles. Based on particles, it is possible to identify the dependency relationship as will be described later. Adjectives often eliminate polysemy of words.

When no sentence pair including an input keyword is found from the parallel corpus database (52) in the sentence pair extraction step, the flow may return to the start. In

this case, the input unit (40) prompt the user to input another similar keyword. Alternatively, the original keyword may be automatically converted into another similar keyword by using a thesaurus.

To this end, the processing unit (51) additionally includes a keyword modification unit (not shown) for properly modifying the keyword input via the input unit (40). In this process, if the given keyword includes two or more morphemes, the given keyword is divided into respective morphemes by using a known morphological analysis method thereby obtaining a keyword including no conjunctive particle or case particle. For example, when "否定的な (hiteiteki na)" is given, "な(na)" may can be removed.

Conversely, a conjunctive particle or a case particle may be added to an original keyword such if the resultant keyword is more suitable in searching for sentence pairs from the parallel corpus.

A thesaurus may be stored in the storage means, and part or all of morphemes of a given keyword may be replaced in accordance with the thesaurus.

The keyword-related phrase storage unit (60) extracts English phrases corresponding to the Japanese phrases each including a Japanese keyword from the sentence pairs extracted by the translation pair extractor (50), based on the partial correspondence information, and the keyword-

related phrase storage unit (60) stores the extracted English phrases in a keyword-related phrase table (53). In the specific example shown in Fig. 7, "to the park", "I went", and "with her" are stored in the keyword-related phrase table (53).

The obtained keyword-related phrase table (53) is input to the text generator (70) shown in Fig. 10 to generate an English text sentence.

A specific example of a technique to, when some words are input, generate a text sentence including the input words is disclosed by the present applicant in Japanese Unexamined Patent Application No. 2003-271592 cited earlier. This technique is used in the present invention to generate text sentences in the target language such as English.

Fig. 10 shows a specific example of a configuration of the text generator (70). The text generator (70) can be realized, for example, using a personal computer including a CPU and an external storage unit such as a hard disk. The processing is performed mainly by the CPU and results are stored in a memory or the external storage unit.

In the present example, when a given English keywordrelated phrase is not a word sequence but a content word
which can serve as a subject in a word sequence, a word
sequence candidate is generated before a text candidate
generator (73) generates a text sentence candidate, because

there is a possibility that when the given English keyword-related phrase includes only a content word, the text candidate generator (73) cannot correctly determine the dependency relationship with other English keyword-related phrases and thus cannot generate a correct text sentence.

In the word sequence generation process, English keyword-related phrase (53) is used in a process performed by a word sequence generation rule acquisition unit (71) and a process performed by a word sequence candidate generator (72). Hereinafter, of English keyword-related phrases (53), those which include only a content word which can serve as a subject of a word sequence will be referred to as English keyword-related words. When a given English keyword-related phrase (53) is an English keyword-related word, the English keyword-related word is processed by the word sequence candidate generator (72), while when the given English keyword-related phrase (53) is not an English keyword-related word, the English keyword-related word, the English keyword-related phrase (53) is not an English keyword-related word, the English keyword-related phrase (53) is

A word is regarded as a content word when the part of speech of the word is a verb, an adjective, a noun, a demonstrative, an adverb, a conjunction, an attribute, or an exclamation or when the word consists of an undefined morpheme, but otherwise the word is regarded as a functional word.

When English keyword-related words are given, the word sequence generation rule acquisition unit (71) searches for sentence pairs including each English keyword-related word from the parallel corpus (75) and performs morphological analysis and syntactic analysis (dependency analysis).

The word sequence generation rule acquisition unit (71) extracts word sequences including each English keyword-related word from the sentence pairs, and acquires a word sequence generation rule (76) indicating how to generate an English keyword-related phrase (53) from an English keyword-related word. The acquired word sequence generation rule (76) is stored. Since the word sequence generation rule is acquired from the parallel corpus (75), a Japanese word corresponding to the English keyword-related word can be simultaneously generated.

For example, "before the end of 1995/一九九五年中の(1995 nen chu no)" is acquired from "1995", and "to the possibility/可能性に(kanousei ni)" is acquired from "possibility". Those acquired word sequence generation rules (76) are stored.

In the example described above, pairs of an English keyword-related phrase and a Japanese keyword-related phrase are generated from English keyword-related words.

Alternatively, pairs of an English keyword-related phrase and a Japanese keyword-related phrase may be generated from

Japanese keywords.

Word sequence generation rules can be automatically acquired as follows. When a set of English keyword-related phrases is denoted by V, and a set of rules indicating how to generate a word sequence from an English keyword-related phrase  $k \in V$  is denoted by Rk, the rule  $rk \in Rk$  can be represented in the following form:

 $k \rightarrow hk m*$ 

where hk denotes subject morphemes including an English keyword-related phrase, and m\* denotes an arbitrary number of successive morphemes that are included in the same word sequence and that are located immediately after hk. When an English keyword-related word is given, a rule that satisfies the above-described form is automatically acquired from the corpus (75) in the target language.

The word sequence candidate generator (72) generates word sequence candidates to be included in an English text sentence (32) to be output, from input English keyword-related words (53) in accordance with the word sequence generation rules (76). When a Japanese text sentence is also output, Japanese word sequence candidates are also generated in the above process.

For example, when "1995" is given, it is not so easy to be a word sequence from which to generate a natural text sentence. Thus, a word sequence for use in the text

sentence generation process, such as "before the end of 1995" or "in 1995", is generated by adding words having a close relation with "1995" to "1995".

In the present example, as described above, the word sequence generation rule acquisition unit (71) acquires a word sequence generation rule indicating how to generate a word sequence from an English keyword-related word (53) (and Japanese keyword-related word) based on the parallel corpus (75). Thus, the word sequence generation rule can be efficiently generated with a minimum amount of computation. This contributes to an improvement in processing speed.

Note that it is not necessarily needed to extract words associated with an English keyword-related phrase from the corpus, but arbitrary words may be added to an input English keyword-related word (53) although a high computational power is required. Alternatively, a bilingual dictionary database may be prepared, and a word sequence may be generated from idiomatic expressions included in the bilingual dictionary database. For example, when "possibility" is given, "to the possibility" may be acquired from the bilingual dictionary database.

In Japanese, a subject is often omitted. In such a case, a subject is added when a word sequence candidate is generated. For example, when "response" is given, "He responded" can be acquired. In Japanese, a subject is

omitted when it is clear what is the subject. A formal subject is also often omitted. Thus, when there is no subject, "It is responded that" may be generated from "respond" without generating "He responded".

A text sentence candidate is then generated by the text candidate generator (73). The text sentence candidate is expressed in the form of a graph or a tree. For example, when "to the park", "I went ...", and "with her" are given as English keyword-related phrases (53), a text sentence candidate is expressed as follows.

That is, as shown in Fig. 11, dependency relations among English keyword-related phrases (53a), (53b), and (53c) are assumed, and a text sentence candidate (54) is generated in the form of the dependency structure tree whose elements are given by the respective English keyword-related phrases. In the case in which there are three phrases, the number of possible manners of dependency among three phrases is equal to  $3! \times 2 = 12$ . The number of manners of dependency can be reduced by taking into account the grammar or property of the target language.

The generated text sentence candidates (54) are evaluated by an evaluator (74) based on an English keyword-related phrase generation model (77) obtained via learning of the corpus or a language model (78), and scores are given to the respective text sentence candidates (54).

The English keyword-related phrase generation model (77) and the language model (78) based on a morpheme model and a dependency model are described in further detail below. The English keyword-related phrase generation model is based on models (KM1 to KM5) depending on the type of information used, as described below. In the following discussion, it is assumed that the set of English keyword-related phrases V consists of subject words that appear as a greater number of times in the corpus than a predetermined value, and word sequences can be expressed in the above-described form. Ιt is also assumed that English keyword-related words independent of each other, and when a text sentence consisting of a word sequence  $w_1...w_m$  is given English keyword-related words correspond to words  $w_j$  (1  $\leq$  j  $\leq$  m). Fig. 12 shows the model.

[KM1] Two words before a word of interest are taken into account (trigram).

It is assumed that  $k_{i}$  depends only on two words  $w_{j\text{--}1}$  and  $w_{j\text{--}2}$  located before  $k_{i}\,.$ 

$$P(K|M, D, T) = \prod_{i=1}^{n} P(k_i|w_{j-1}, w_{j-2})$$

[KM2] Two words after a word of interest are taken into account (backward trigram).

It is assumed that  $k_{\bf i}$  is related only to two words  $w_{j+1}$  and  $w_{j+2}$  located after  $k_{\bf i}\,.$ 

$$P(K|M,D,T) = \prod_{i=1}^{n} P(k_i|w_{j+1},w_{j+2})$$

[KM3] A modifying word sequence is taken into account (modifying word sequence).

When there is a word sequence that modifies a word sequence including  $k_i$ ,  $k_i$  is assumed to be related only to two words  $w_1$  and  $w_{l-1}$  located at the end of the modifying word sequence (See Fig. 12).

$$P(K|M, D, T) = \prod_{i=1}^{n} P(k_i|w_i, w_{l-1})$$

[KM4] A modified word sequence is taken into account (modified word sequence).

When there is a word sequence that is modified by a word sequence including  $k_i$ ,  $k_i$  is assumed to be related only to two words  $w_s$  and  $w_{s+1}$  in the modified word sequence (See Fig. 12).

$$P(K|M, D, T) = \prod_{i=1}^{n} P(k_i|w_s, w_{s+1})$$

[KM5] Up to two modifying word sequences are taken into account (two modifying word sequences).

When there are word sequences that modify a word sequence including  $k_i$ ,  $k_i$  is assumed to be related only to two words  $w_1$  and  $w_{l-1}$  located at the end of a modifying word sequence closest to the end of a sentence and two words  $w_h$  and  $w_{h-1}$  located at the end of a modifying word sequence closest to the beginning of the sentence (Fig. 12).

$$P(K|M,D,T) = \prod_{i=1}^{n} P(k_i|w_i, w_{l-1}, w_h, w_{h-1})$$

Now, the morpheme model (MM) is discussed. Herein, it is assumed that one grammatical attribute is given to each morpheme. When a text sentence, that is, a character string is given, the model determines a probability value indicating the likelihood that the given character string is a morpheme and it has a  $\{j\}$ th  $(1 \le j \le l)$ grammatical attribute.

When a text sentence T is given, if morphemes  $m_i$  (1  $\leq$  i  $\leq$  n) are independent, the probability that an ordered set of morphemes M is obtained is given by:

$$P(M|T) = \prod_{i=1}^{n} P(m_i|m_1^{i-1}, T)$$

where  $m_i$  indicates one of 1st to {1}th grammatical attributes.

On the other hand, in the dependency model (DM), when a

text sentence T and an ordered set of morphemes M are given, if dependencies  $d_1 \dots d_n$  are independent, the probability that an ordered set of dependencies D associated with respective word sequences is obtained is given by:

$$P(D|M,T) = \prod_{i=1}^{n} P(d_i|M,T)$$

For example, when three English keyword-related phrases (53), "to the park", "I went", and "with her" are given, if two candidates "I went with her to the park." and "I went to the park with her" are generated from the three English keyword-related phrases (53), a candidate with a greater likelihood score calculated based on the dependency model is selected.

In the present example, the evaluator (74) evaluates the text sentence candidates (54) using the models described above.

In the evaluation performed by the evaluator (74) based on the above-described method, dependency among phrases and the likelihood in terms of arrangement of morphemes are taken into account. Thus, a correct form in terms of, for example, the presence/absence of a suffix "s" for the third person singular has a high score in the evaluation. This means that the grammatical accuracy is also evaluated in the evaluation.

A text sentence candidate with a highest score, text sentence candidates with score greater than a predetermined threshold, or as many text sentence candidates with highest scores as a predetermined number N are converted into surface sentences and output.

The resultant sentences are output from the output unit (80) such that they are displayed on a monitor, a synthesized voice is output, or electronic data is output to a language processing system such as a translation system. If necessary, text sentence data indicating the resultant sentences may be transmitted to another computer connected to the apparatus via a network.

Finally, for the English text sentence (32) generated by the apparatus/method according to the present invention, a grammatical correction process may be performed. Although a certain degree of grammatical accuracy is achieved in the generated sentences as described above, there is a possibility that grammatical errors such as an error in terms of tense or a lack of a preposition or a subject occur. One method of correcting such errors is to use a known error correction technique used in the OCR (optical character recognition).

When an English sentence has an error in terms of tense (represented in perfect tense, progressive form, etc.) or modality (represented by "may", "can", or "must"), the error

may be corrected, for example, using a technique disclosed in Japanese Patent No. 3388393 granted to the present applicant.

For example, "彼女と公園に行った(Kanojo to kouen he itta.)" is determined as being in the past tense, and a corresponding English sentence must be in the past tense. If not so, an error is corrected. "彼女と公園に行ってきたところだ(Kanojo to kouen ni ittekita tokoro da.)" is determined as being in the present perfect tense, and a corresponding English sentence must be in the present perfect tense. For a Japanese sentence "彼女と公園へ行くだろう(Kanojo to kouen he iku darou.)", "may" must be used in a corresponding English sentence.

Machine learning may be performed in terms of grammatical error patterns, and errors in terms of the suffix "s" to verbs in the present tense in sentences in which the subject is third person singular or errors in terms of prepositions may be detected and corrected by mentioned below document 1.

## [Document 1]

Emi Izumi, Kiyotaka Uchimoto, Toyomi Saiga, Thepchai Supnithi, and Hitoshi Isashara, "Automatic Error Detection in the Japanese Learners' English Spoken Data", Proceedings of the ACL2003 Interactive Poster/Demo Sessions pp.145-148,

2003.

## (Example 2)

Fig. 3 is a flow chart showing processing according to example 2 of the present invention. In the example 2, when a plurality of sentence pairs are extracted (2) for an input Japanese keyword (1), if two or more different Japanese phrases related to the Japanese keyword (1) are extracted from the partial correspondence information associated with the sentence pairs, a correct Japanese keyword-related phrase is selected (20).

The process is described in further detail with reference to Fig. 9. The translation pair extractor (50) extracts sentence pairs including a Japanese keyword (31) from the parallel corpus database (52). For example, when "彼女(kanojo)" is input as a keyword, if "彼女が(kanojo ga)", "彼女と(kanojo to)", and "彼女に(kanojo ni)" are extracted as Japanese keyword-related phrases from a plurality of sentence pairs. Then a Japanese phrase candidate presenter (61) presents to a user all these extracted Japanese keyword-related phrases. In response, the user selects a best one from the presented phrases.

More specifically, the extracted Japanese keywordrelated phrases are displayed on the monitor (64), and the user selects a best phrase using the mouse (62) or the keyboard (63). A touch panel monitor (65) may be used to provide a good user interface for the same purpose.

In this specific example, when "公園(kouen)" is input, "公園へ(kouen he)/to the park" and "公園で(kouen de)/in the part" are presented as candidates. When "行く(iku)" is input, "行く(iku)/I will go" and "行った(itta)/I went" are presented as candidates. As described above, each time a user inputs a Japanese keyword, Japanese keyword-related phrases are extracted from the parallel corpus database (10) and presented to the user such that the user can select a best one from the presented phrases. This allows the user to easily specify correct Japanese phrases, and specifying correct Japanese phrases makes it possible to generate a correct text sentence.

It is known in the art to, in response to inputting of a first character in alphabet or Japanese kana, display all word sequences that begin with the input character. For example, when "k" is input, word sequences such as "彼は(kare ha)", "彼女は(kanojo ha)", "今日(kyou)", etc. are displayed. When "an" is input following "k" and thus "kan" is input, displayed word sequences are narrowed down to "彼女と(kanojo to)", "彼女が(kanojo ga)", etc. In a case in which it is difficult to directly extract Japanese keyword-related phrases from the parallel corpus database each time one character is input during the inputting of a Japanese

keyword, words which begin with the input character(s) may be extracted from a dictionary database prepared separately from the parallel corpus database, and Japanese phrase including each word may be extracted from the parallel corpus database.

## (Example 3)

Fig. 4 is a flow chart showing processing according to example 3 of the present invention. In example 3, when a sentence pair is extracted (2), phrases that co-occur with a keyword are extracted from the sentence pair (21). The extracted co-occurring phrases are presented to a user (22). If the user selects a co-occurring phrase, the selected phrase is employed as a new keyword (1).

For example, as shown in Fig. 13, at the point of time at which Japanese keywords "彼女(kanojo)" and "公園(kouen)" have been input, the sentence pair extractor (50) extracts a sentence pair "彼女と公園へ行った(Kanojo to kouen he itta)/I went to the park with her", and the co-occurring phrase extractor (66) extracts "行った(itta)" as a co-occurring phrase that co-occurs with "彼女と(kanojo to)" and "公園へ (kouen he)". Techniques to extract co-occurring phrases are known in the art.

A co-occurring phrase presenter (67) presents "行った (itta)" to the user by displaying it on the monitor (64).

When the user determines to employ it as a new keyword, the user selects it using the mouse (62) or the keyboard (63) thereby inputting it to the translation pair extractor (50) or the word/phrase pair storage unit (60) stores "公園へ (kouen he)/to the park" in a keyword-related phrase table (53).

In the former case, a further phrase that co-occurs with the selected co-occurring phrase may be selected. However, this results in a great increase in the number of extracted sentence pairs. In the latter case, such an increase does not occur.

### (Example 4)

In Example 4 of the present invention, as shown in Fig. 5, when a Japanese keyword is input, text sentences in two different target languages are generated at the same time.

In the example shown in Fig. 5, Japanese-English sentence pairs are extracted (2a) from a Japanese-English corpus database (10a), and Japanese-Thai sentence pairs are extracted (2b) from a Japanese-Thai corpus database (10b). Keyword-related phrases are extracted from respective partial correspondence information (11a) and (11b) and the extracted keyword-related phrases are stored (3a), (3b) in keyword-related phrase tables (12a) and (12b), respectively. Text sentence candidates are generated (4a), (4b) from

keyword-related phrases stored in the keyword-related phrase tables (12a) and (12b). The generated text sentence candidates are evaluated (5a), (5b), and properly selected English text sentence (6a) and Thai text sentence (6b) are output at the same time.

The processing methods employed in the examples 1 to 3 described above may also be employed in this example 4.

The example 4 is very useful in particular when a user communicates via a network with a plurality of other users who speak different languages, because text sentences in different languages are output at the same time.

### (Example 5)

In example 5, Japanese text sentence candidates and English text sentence candidates are generated at the time in the text sentence candidate generation step, and generated text sentence candidates are presented to a user. This allows the user to easily recognize what has been generated as the text sentence in the target language by reading the corresponding Japanese text sentence.

As shown in Fig. 6, when keyword-related phrases are stored (3), pairs of Japanese and English keyword-related phrases are stored in the keyword-related phrase table (12), and Japanese text sentence candidates are generated when English text sentence candidates are generated (23). If the

same dependency relationships among phrases are assumed for both languages, the generated text sentences in both languages are equivalent to each other. Thus, the user can understand the meaning of the English text sentence by reading the corresponding Japanese text sentence.

In this method, the user can select Japanese phrases that are correct in terms of dependency relationship thereby correctly specifying dependency relationships among English phrases. This makes it possible to generate a natural text sentence in which dependency relationships are correctly represented, based on English phrases.

### (Example 6)

In the examples described above, Japanese keywords are directly input. The present invention can be implemented below mentioned system and used. That is, in this system, as shown in Fig. 14, a user inputs not Japanese keywords but a Japanese text sentence. For example, if the user inputs "彼女は公園に行った(Kanojo ha kouen he itta)" via an input unit (40)' (similar to the input unit (40) except that a text sentence is input instead of keywords), a keyword extractor (90) extracts keywords as shown in Fig. 15.

Fig. 5 shows an example of a configuration of the keyword extractor (90). In this keyword extractor (90), processing is performed by a CPU in cooperation with a

memory. The keyword extractor (90) extracts keywords playing an important role in representing the content of the text sentence from the input Japanese text sentence.

Various techniques to extract keywords are known and actually used in generating a summary of a document or in document searching. Any of these techniques can be used in the present example. By way of example, a technique is used herein which is disclosed in document 2 mentioned below.

# [Document 2]

"Measuring of Representativeness of Terms", Tohru
Hisamitsu, Yoshiki Niwa, and Junichi Tsujii, Technical
Report of Special Interest Group of Natural Language
Processing, Information Processing Society of Japan, 1999NL-133.

In this method, the news hook of a word, or representativeness (in the description, it is called characterisity) of words appearing in a document is numerically measured in order to select a characteristic word, and keywords are selected based on the measurement result. Thus, this method can be advantageously used in the present invention. The method is briefly described below.

First, in the keyword extractor (90), a morphological analyzer (91) morphologically analyzes a given Japanese text

sentence by using a known morphological analysis method.

The morphemes acquired via the analysis are stored in the form of a morpheme table in a memory or an external storage unit which is not shown.

Morphemes stored in the morpheme table are read one by one, and the characterisity of each morpheme (hereinafter, also referred to as a term of interest) is measured.

A document extractor (92) extracts all documents including the term of interest W from a particular document database (93). The document database (93) includes a plurality of documents in Japanese (source language) and is stored in an external storage unit or the like. A Japanese corpus or a Japanese part of a Japanese-English corpus may be used as the document database (93).

A word distribution calculator (94) calculates the word distribution over a set of documents including the term of interest W and also calculates the word distribution over all documents included in the document database (93). The word distribution calculator (94) then measures the degree of difference between the two word distributions.

More specifically, the degree of difference is calculated by a difference calculator (95) as described below.

The term of interest is denoted by W, the set of all documents including W is denoted by D(W), the set of all

documents is denoted by  $D_o$ , and the word distribution in D(W) is denoted by  $P_{D(W)}$ , and charecterisity of the word W are defined Rep(W) as words distribution  $P_o$  in  $D_0$  are defined using the distance  $Dist\{P_{D(W)},\ Po\}$  between the two distributions $\{P_{D(W)},\ Po\}$ .

In the present example, the distance between the two word distributions is measured using a log likelihood ratio. That is, when a set of all words is denoted by  $\{W_1, \ldots, W_n\}$ , the frequency of occurrence of a word  $W_i$  in D(W) and  $D_o$  are respectively denoted by  $k_i$  and  $K_i$ , the distance  $Dist\{P_{D(W)}, Po\}$  between  $P_{D(W)}$  and Po is defined as follows:

$$Dist(P_{D(W)}, P_0) = \sum_{i=1}^{n} k_i \log \frac{k_i}{\#D(W)} - \sum_{i=1}^{n} k_i \log \frac{K_i}{\#D_0}.$$

where #D(W) is the number of words of the term of interest W included in D(W), and #Do is the number of words included in all documents. The definition according to the above formula has a difficulty in comparing the representativeness of terms whose #D(W) is greatly different. To avoid the above difficulty, the representativeness Rep(W) is normalized as shown below:

 $Rep(W = Dist(P_{D(W)}, Po)/B(\#D(W))$ 

where  $B(\cdot)$  is an approximation function using an exponential function defined so as to obtain high accuracy in characterisity for a range in which #D(W) has proper values

(for example,  $1000 \le \#D(W) \le 20000$ ).

When #D(W) is very large as is the case with "#D(W)", the number of D(W) may be limited such that  $\#D(W) \le 20000$  is satisfied and thus the approximation function is effective. This also allows a reduction in the amount of computation.

In the keyword extractor (90), after completion of calculating the characterisity in the above-described manner, a keyword determination unit (96) extracts keywords from the input Japanese text sentence in accordance with a predetermined threshold value.

Thus, for example, "彼女(kanojo)/She", "公園(kouen)/park", and "行く(iku)/go" are extracted as keywords. Thereafter, a translation pair extractor (50') extracts sentence pairs from the parallel corpus database (10) in a similar manner to the previous examples. Note that there is a possibility that other sentence pairs such as "彼女は動物園へ行った(Kanojo ha doubutsuen he itta.)/She went to the zoo." are also extracted in the sentence pair extraction step.

Thereafter, the keyword-related storage unit (60') extracts and stores keyword-related phrases in a similar manner to the previous examples described above. A text sentence is then generated by the text generator (70').

Processing units (40'), (50'), (60') and (70') are similar to corresponding processing units (40), (50), (60),

and (70) in the previous examples. These counterparts are similar in structure to each other unless otherwise noted.

In the text generator (70') having a similar structure to that of the text generator (70) shown in Fig. 10 used in the previous examples, text sentence candidates having a score greater than a threshold value is selected by the evaluator (74) and pairs of text sentences in Japanese and English are output as in the example 5. Finally, a similarity evaluator (100) evaluates the similarity between a Japanese text sentence in each output pairs of sentences and the original input Japanese text sentence.

A method of evaluating the similarity is to calculate the coincidence of character string between the two text sentences. Another method is to compare the result of a translation obtained by means of machine translation with the result of a translation performed by a human translator in units of character strings (or in units of words), and calculate the similarity based on the comparison result. A specific example of this technique is disclosed in document 3 mentioned below.

#### [Document 3]

"Bleu: a Method for Automatic Evaluation of Machine Translation", Kishore Papineni, Salim Roukos, Todd Ward, Wei-Jing Zhu, IBM Research Report, RC22176 (WO109-022), 2001.

For example, the similarity evaluator (100) evaluates the similarity of "彼女と公園へ行った(Kanojo to kouen he itta)" and "彼女は公園へ行った(Kanojo ha kouen he itta)" generated by the text generator (70') relative to the original input text sentence "彼女は公園へ行った(Kanojo ha kouen he itta)", and selects more similar sentence of "彼女は公園へ行った(Kanojo ha kouen he itta)/She went to the park" and output it from the output unit (80').

The present invention has been described above with reference to examples 1 to 6. Although units (40), (50), (60), (70), and (80) were described separately for the convenience of explanation, these units may be implemented on a single personal computer or the like. In particular, it is desirable that a CPU, a memory, an input/output unit, a network adapter (not shown), and an external storage unit be shared by the units (40), (50), (60), (70), and (80) to simplify the apparatus.

The parallel corpus database (10) and the corpus (75) stored in the external storage unit may be realized using a part or all of a single database.

The parallel corpus database (10) and the corpus (75) are not necessarily needed to be stored in the external storage unit but data may be collected from a plurality of serves via a network.

The present invention has great advantages as described above. The present invention can provide a method of generating a text sentence in a target language different in a source language and an apparatus thereof that when one or more keyword in a source language are given, a text sentence in the target language is generated from keywords and can output, and the process of generating a text sentence is simple compared with the process of generating a text sentence from a text sentence in the source language, and it is possible to generate a very natural text sentence including no error which often occurs in the technique based on analysis of a text sentence in the source language.

Additionally, The present invention can provide a method of generating a text sentence in a target language different in a source language and an apparatus thereof that keyword-related words/phrases in the source language are presented to a user, the presentation of the words/phrases in the source language allows the user to easily understand the words/phrases and select a correct word/phrase, the selection of the correct keyword-related words/phrases makes it possible to generate a correct text sentence in the target language.

More over, the present invention can provide a method of generating a text sentence in a target language different

in a source language and an apparatus thereof that a given keyword is modified, and a source/target language sentence pair is extracted correctly and efficiently based on the modified keyword, in a case in which a given keyword includes a plurality of morphemes, for example, a particle following a word may be removed or converted into a standard form such that sentence pairs including a word similar to but partially different from the original keyword can be correctly extracted from the parallel corpus database, as required, the original keyword may be replaced with a synonym, a narrower-sense word, or a wider-sense word.

The present invention can provide a method of generating a text sentence in a target language different in a source language and an apparatus thereof that when one or more keywords in the source language are given, text sentences of two or more target languages are generated from the given keywords, thus, generation of text sentence is performed in a very efficient manner, and makes it possible for a user to communicate at the same time with a plurality of other users speaking different languages.

Further, the present invention can provide a method of generating a text sentence in a target language different in a source language and an apparatus thereof that a text sentence candidate in the source language is output together with a text sentence candidate in the target language, and

thus a user can recognize the exact meaning of the generated text sentence in the target language.

The present invention can provide a method of generating a text sentence in a target language different in a source language and an apparatus thereof that the generated text sentences are evaluated and one or a predetermined number of text sentence candidates are selected and output, for example, a particular number of text sentence candidates with highest scores calculated based on a learning model described later may be output.

## Industrial Applicability

By inputting one or more keyword of a mother language, a text sentence in the target language is generated, it makes contribution to an improvement of translation technique, therefore, it has an industrial applicability.